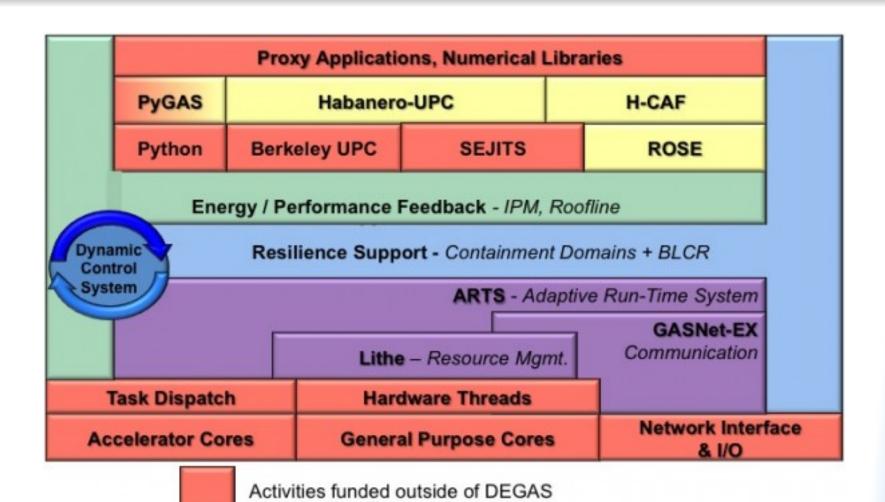
LITHE Composing Parallel Software Efficiently

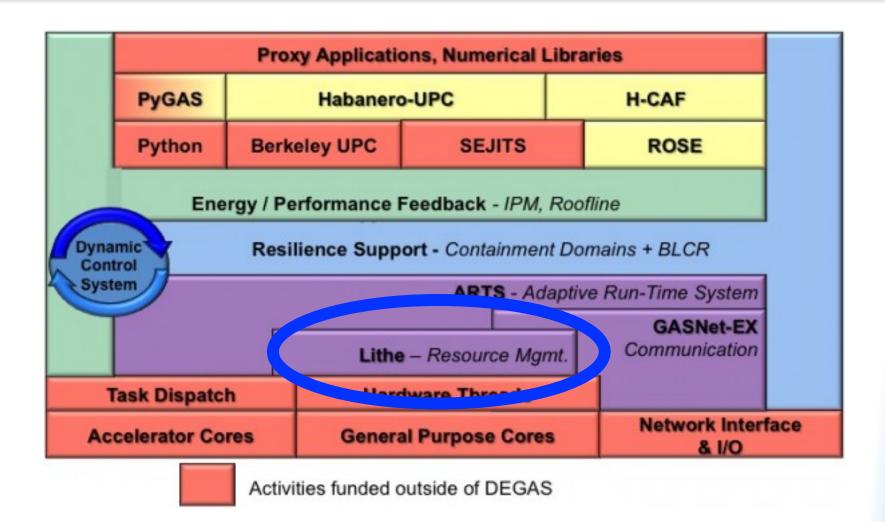
Kevin Klues klueska@cs.berkeley.edu

DEGAS Summer Retreat June 4th, 2013 http://lithe.eecs.berkeley.edu

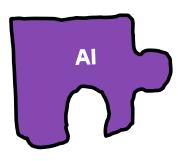
Where Does Lithe Fit?



Where Does Lithe Fit?

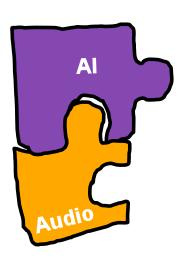


```
game() {
   forall frames:
     AI.compute();
```

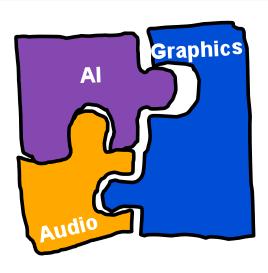


}

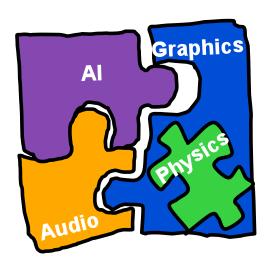
```
game() {
   forall frames:
      AI.compute();
   Audio.play();
```



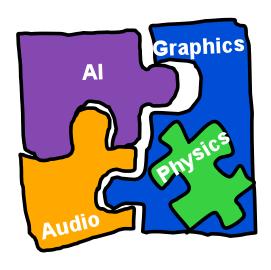
```
game() {
   forall frames:
      AI.compute();
   Audio.play();
   Graphics.render();
```



```
game() {
   forall frames:
       AI.compute();
       Audio.play();
       Graphics.render() {
       Physics.calc ();
       :
    }
}
```

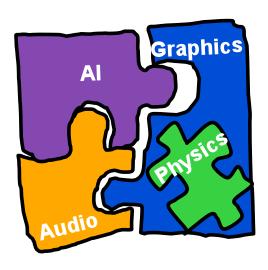


```
game() {
   forall frames:
        AI.compute();
        Audio.play();
        Graphics.render() {
        Physics.calc ();
        :
     }
}
```



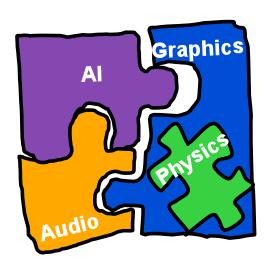
• Productivity: Don't want to implement & understand everything.

```
game() {
   forall frames:
        AI.compute();
        Audio.play();
        Graphics.render() {
        Physics.calc ();
        :
     }
}
```



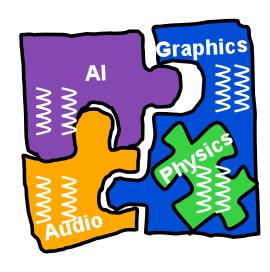
- Productivity: Don't want to implement & understand everything.
- Performance: Leverage language & runtime optimizations within components.

```
game() {
   forall frames:
       AI.compute();
       Audio.play();
       Graphics.render() {
       Physics.calc ();
       :
     }
}
```

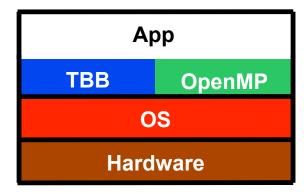


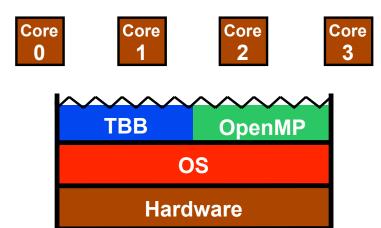
- Productivity: Don't want to implement & understand everything.
- Performance: Leverage language & runtime optimizations within components.
- Diversity: Components may want to use different abstractions & languages.

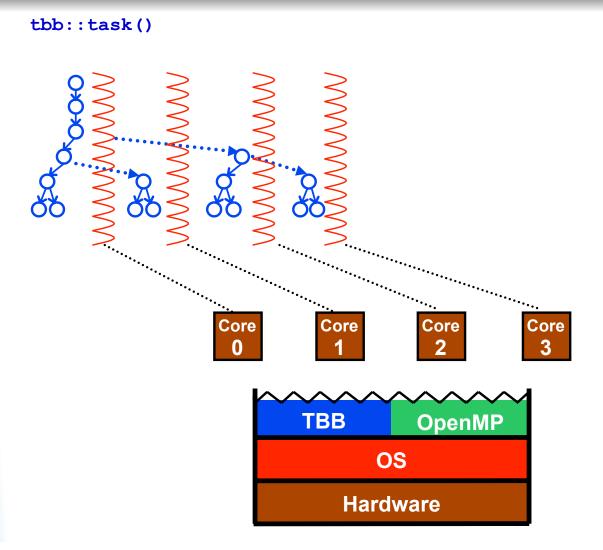
```
game() {
   forall frames:
       AI.compute() ||
       Audio.play() ||
       Graphics.render() {
       Physics.calc ();
       :
    }
}
```

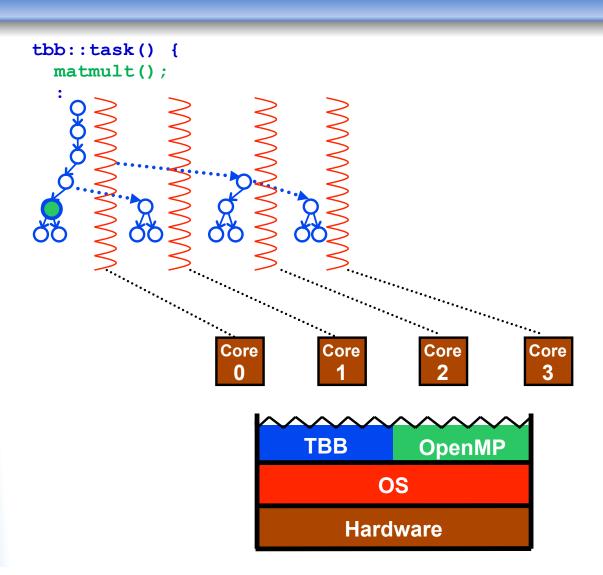


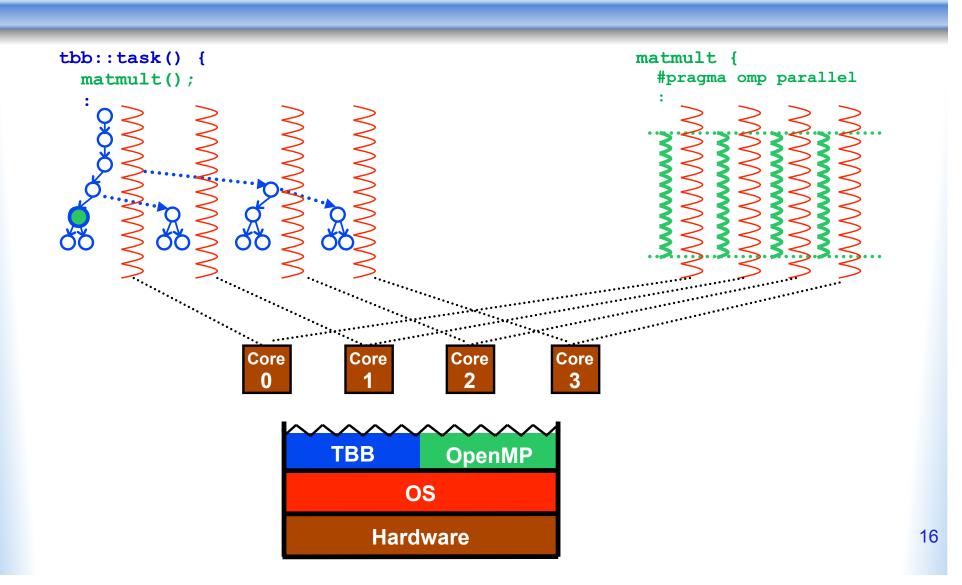
- Productivity: Don't want to implement & understand everything.
- Performance: Leverage language & runtime optimizations within components.
- Diversity: Components may want to use different abstractions & languages.

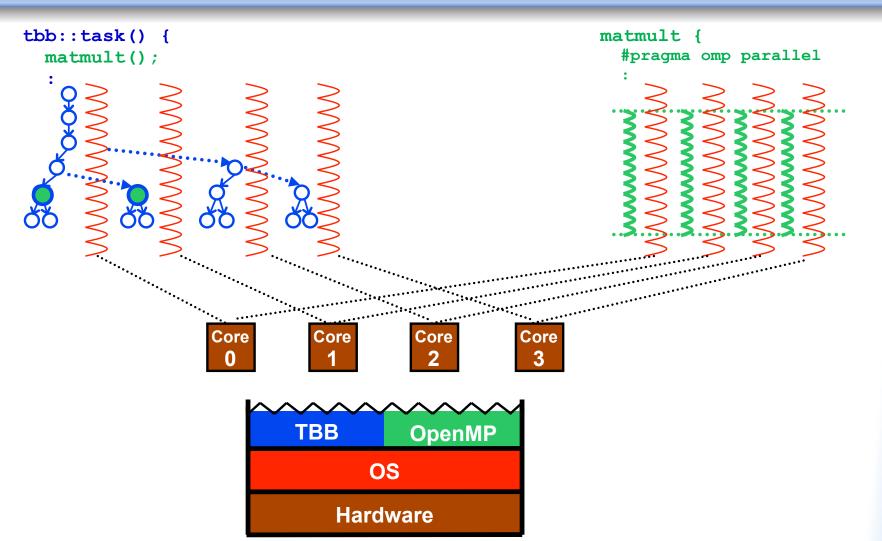


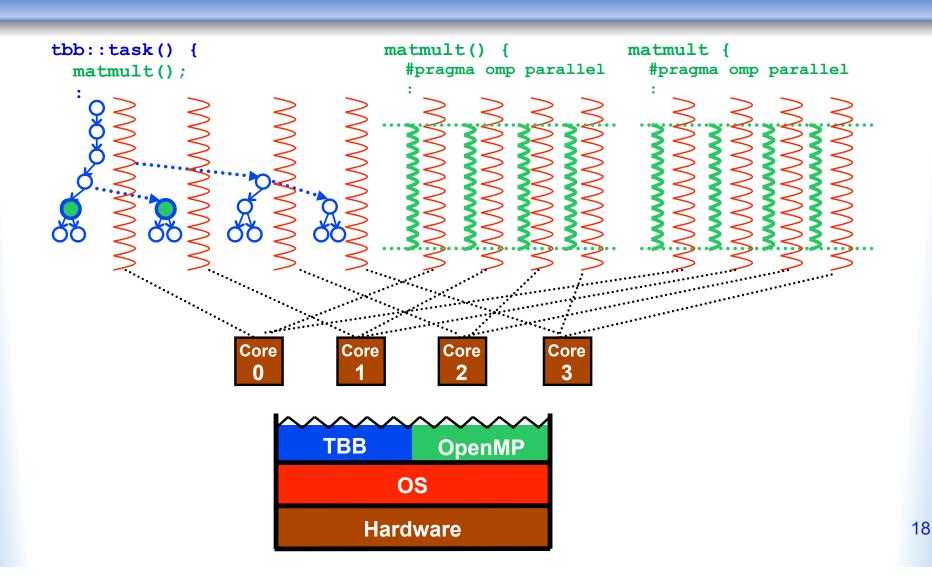












MKL Quick Fix

Using Intel MKL with Threaded Applications

http://www.intel.com/support/performancetools/libraries/mkl/sb/CS-017177.htm

Software Products

Intel® Math Kernel Library (Intel® MKL) Using Intel® MKL with Threaded Applications

- Memory Allocation MKL: Memory appears to be allocated and not released when calling some Intel MKL routines (e.g. sgetrf).
- Using Threading with BLAS and LAPACK
 Setting the Number of Threads for OpenMP (OMP)
- . Changing the Number of Processors for Threading During Runtime Can I use Intel MKL if I thread my application?

Memory Allocation MKL: Memory appears to be allocated and not released when calling some Intel® MKL routines (e.g. sgetrf).

One of the advantages of using the IntelMKL is that it is multithreaded using OpenMP*. OpenMP* requires buffers to perform some operations and allocates memory even for single-processor systems and single-thread applications. This memory allocation occurs once the first time the OpenMP software is encountered in the program. This memory allocation persists until the application terminates. In addition, the Windows' operating system will allocate a stack equal to the main stack for every additional thread created, so the amount of memory that is automatically allocated will depend on the main stack, the OpenMF allocations and the number of threads used.

Using Threading with BLAS and LAPACK

Intel MKL is threaded in a number of places: LAPACK ("GETRF, "POTRF, "GBTRF routines), Level 3 BLAS, DFTs, and FFTs, Intel MKL uses OpenMP* threading software. There are situations in which conflicts can exist that make the use of threads in Intel MKL problemat We list them here with recommendations for dealing with these. First, a brief discussion of why the problem exists is appropriate.

If the user threads the program using OpenMP directives and uses the Intel® Compilers to compile the program, Intel MKL and the user program will both use the same threading library. Intel MKL tries to determine if it is in a parallel region in the program, and if it is, it does not spread its operations over multiple threads. But Intel MKL can be aware that it is in a parallel region only if the threaded program and Intel MKL are using the same threading library. If the user program is threaded by some other means. Intel MKL may operate in multithreaded mode and the computations may be corrupted. Here are several cases and our

- User threads the program using OS threads (pthreads on Linux*, Win32* threads on Windows*). If more than one thread calls Intel MKL and the function being called is threaded, it is important that threading in Intel MKL be turned off. Set OMP_NUM_THREADS=1 in the environment.
- User threads the program using OpenMP directives and/or pragmas and compiles the program using a compiler other than a compiler from Intel.

 This is more problematic because setting OMP_NUM_THREADS in the environment affects both the compiler's threading library and the threading

library with Intel MKL. In this case, the safe approach is to set

- Multiple programs are rupping on a multiple-CPU system. In cluster applications, the parallel program can run separate instances of the program on each processor. However, the threading software will see multiple processors on the system even though each processor has a separate process running on it. In this case OMP_NUM_THREADS should be
- * If the variable OMP_NUM_THREADS environment variable is not set, then the default number of threads will be assumed 1.

Setting the Number of Threads for OpenMP* (OMP)

The OpenMP* software responds to the environment variable OMP_NUM_THREADS:

- . Windows*: Open the Environment panel of the System Properties box of the Control Panel on Microsoft* Windows NT*, or it can be set in the shell the program is running in with the command: set OMP_NUM_THREADS= <number of threads to use>.
- Linux*: To set and export the variableP "export OMP_NUM_THREADS= <number of threads to use>".

Note: Setting the variable when running on Microsoft* Windows* 98 or Windows* Me is

Changing the Number of Processors for Threading During Runtime

this not possible to change the number of processors during runtime using the environment variable OMP_NUM_THREADS. You can call OpenMP API functions from your program to change the number of threads during runtime. The following sample code demonstrates changing the number of threads during runtime using the omp_set_num_threads() routine

#include "omp.h"

#define SIZE 1000

```
a = new double [SIZE*SIZE]:
int m=SIZE, n=SIZE, k=SIZE, lda=SIZE, ldb=SIZE, ldc=SIZE, i=0, j=0;
char transa='n', transb='n';
for( i=0; i<SIZE; i++){
  for( j=0; j<SIZE; j++){
a[i*SIZE+j]= (double)(i+j);
     bfi*SIZE+il= (double)(i*i)
      c[i*SIZE+j]= (double)0;
.
cblas_dgemm(CblasRowMajor, CblasNoTrans, CblasNoTrans,
```

```
printf("row\ta\tc\n");
 for ( i=0:i<10:i++){
    printf("%d:\t%f\t%f\n", i, a[i*SIZE], c[i*SIZE]);
 omp set num threads(1);
 for( i=0: i<SIZE: i++V
    for( i=0: i<SIZE: i++)(
       bli*SIZE+j]= (double)(i*j);
       c[i*SIZE+i]= (double)0;
 cblas_dgemm(CblasRowMajor, CblasNoTrans, CblasNoTrans,
             m, n, k, alpha, a, lda, b, ldb, beta, c, ldc);
  printf("row\ta\tc\n");
  for ( i=0;i<10;i++){
    printf("%d:\t%f\t%f\n", i, a[i*SIZE],
cfi*SIZEI):
  omp set num threads(2):
    for( i=0: i<SIZE: i++){
       a[i*SIZE+j]= (double)(i+j);
        b[i*SIZE+j]= (double)(i*j);
        c[i*SIZE+j]= (double)0;
  cblas_dgemm(CblasRowMajor, CblasNoTrans, CblasNoTrans.
            m. n. k. alpha, a. lda, b. ldb, beta, c. ldc):
  printf("row\ta\tc\n"):
  for ( i=0;i<10;i++){
    printf("%d:\t%f\t%f\n", i, a[i*SIZE],
c[i*SIZE]);
  delete [] a;
  delete [] b:
  delete [] c;
```

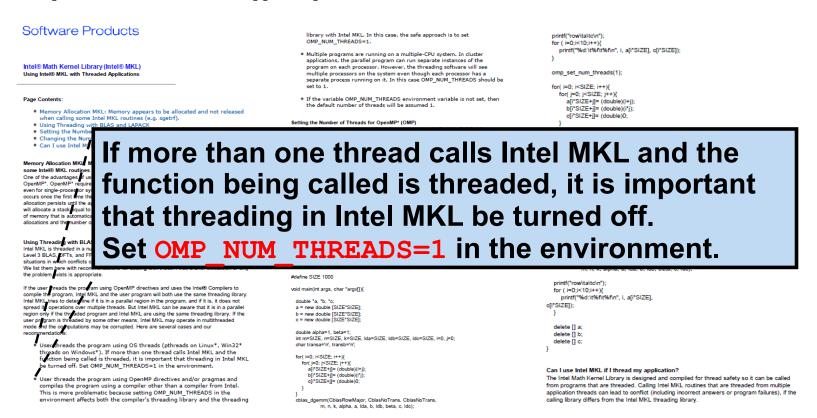
Can I use Intel MKL if I thread my application?

The Intel Math Kernel Library is designed and compiled for thread safety so it can be called from programs that are threaded. Calling Intel MKL routines that are threaded from multiple application threads can lead to conflict (including incorrect answers or program failures), if the calling library differs from the Intel MKL threading library.

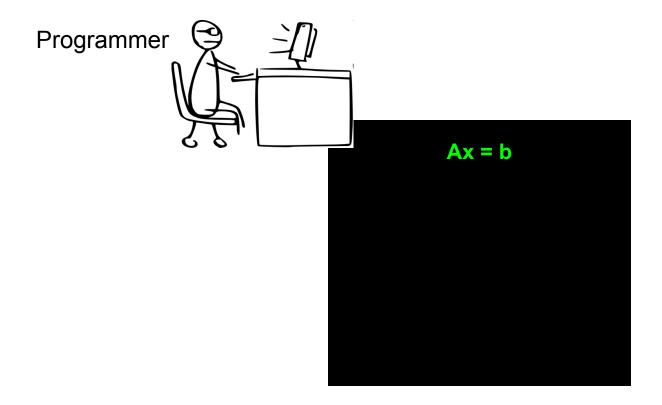
MKL Quick Fix

Using Intel MKL with Threaded Applications

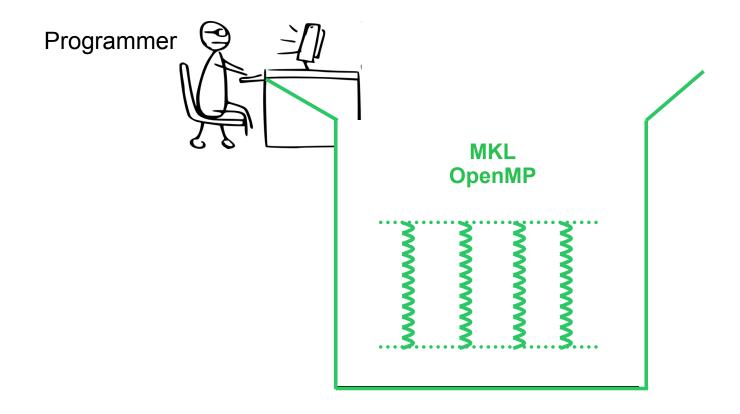
http://www.intel.com/support/performancetools/libraries/mkl/sb/CS-017177.htm



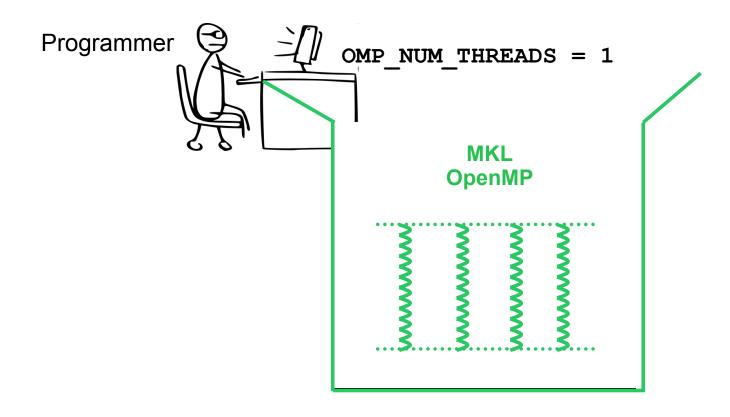
Breaks Black Box Abstraction

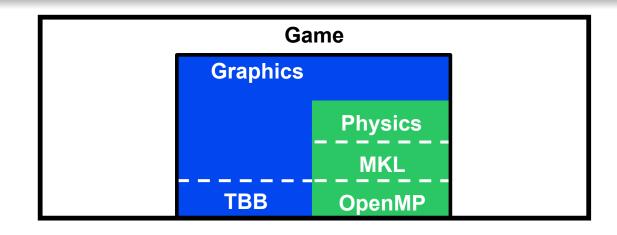


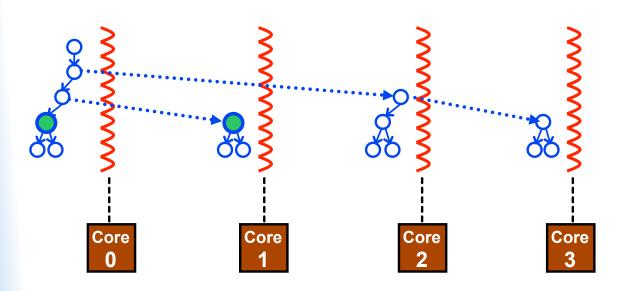
Breaks Black Box Abstraction

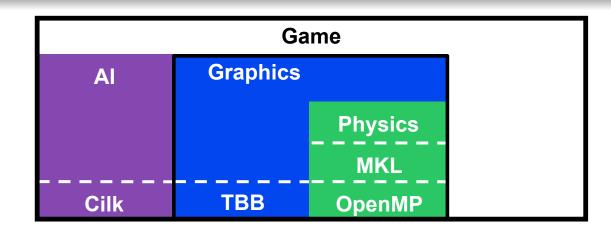


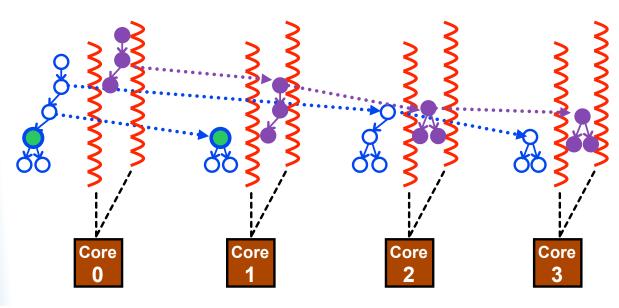
Breaks Black Box Abstraction

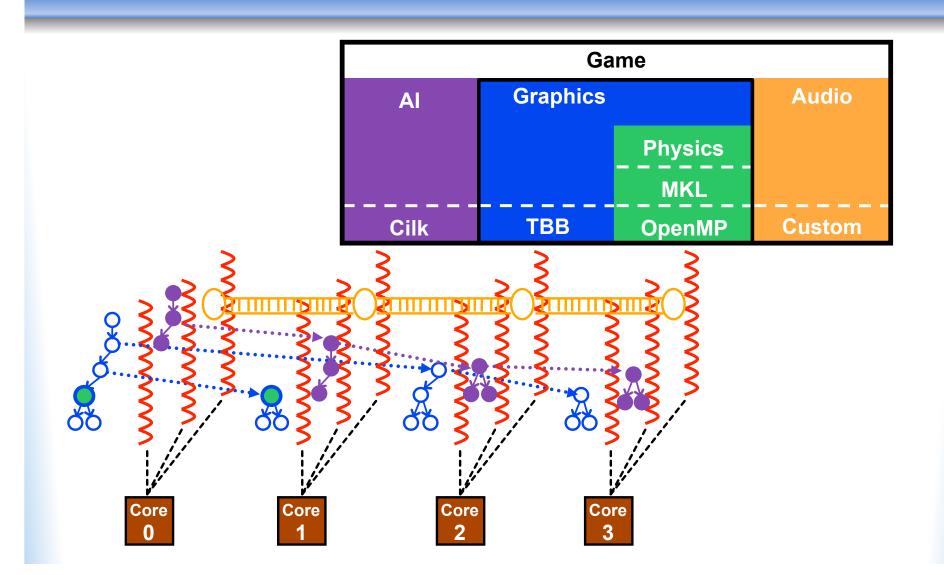


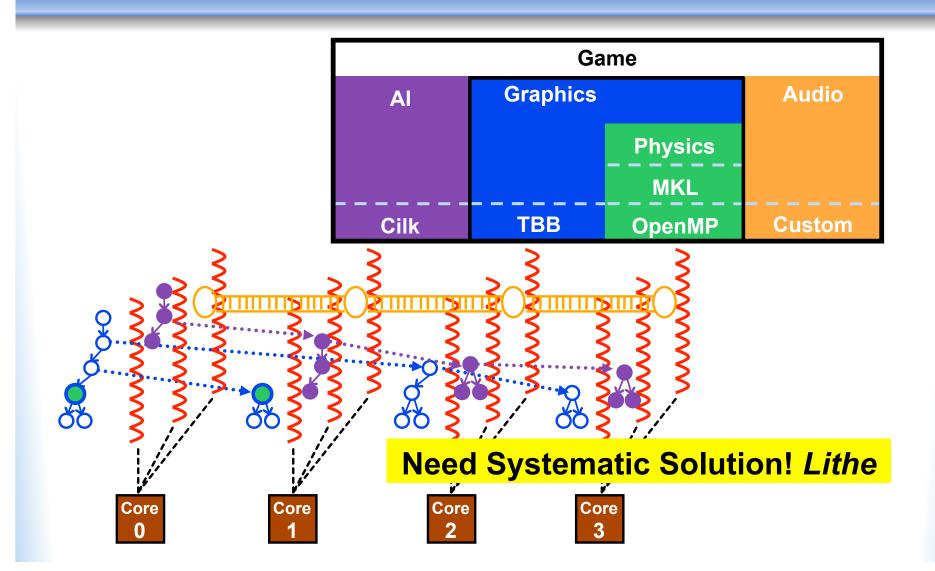


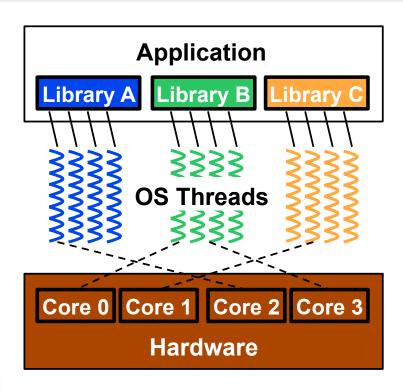


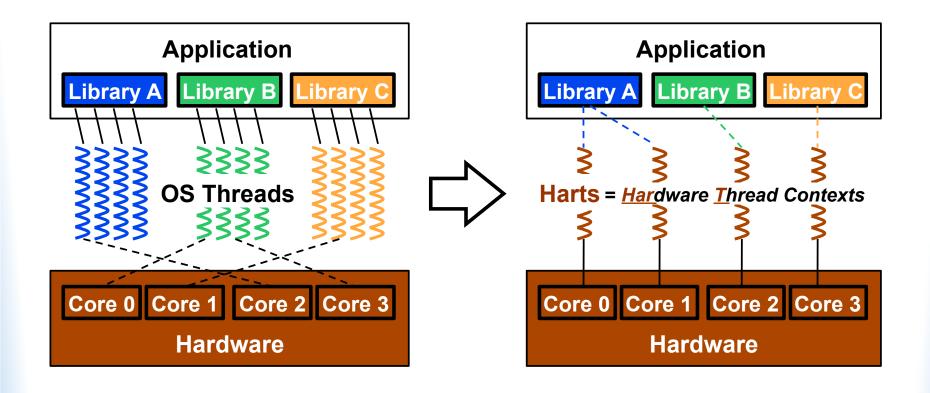


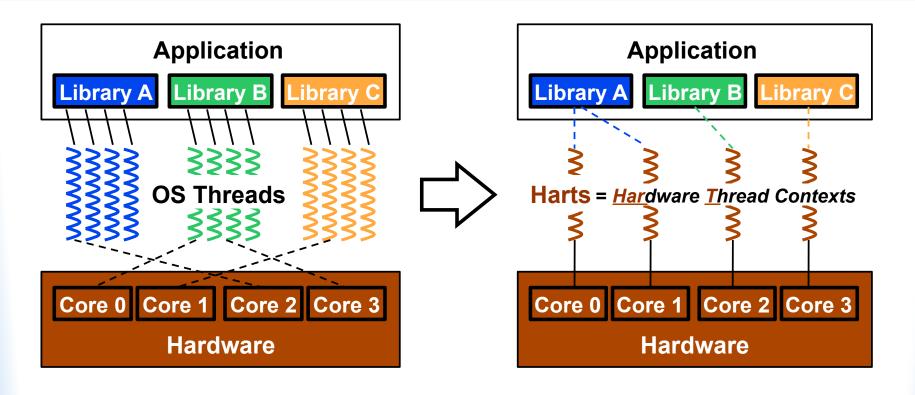






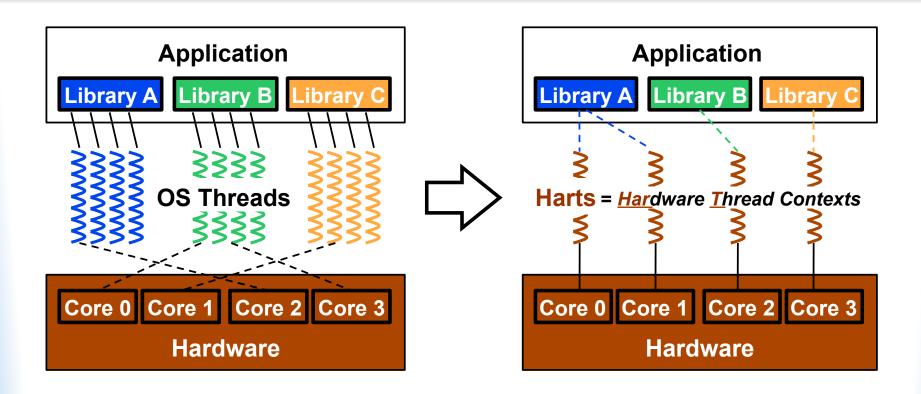






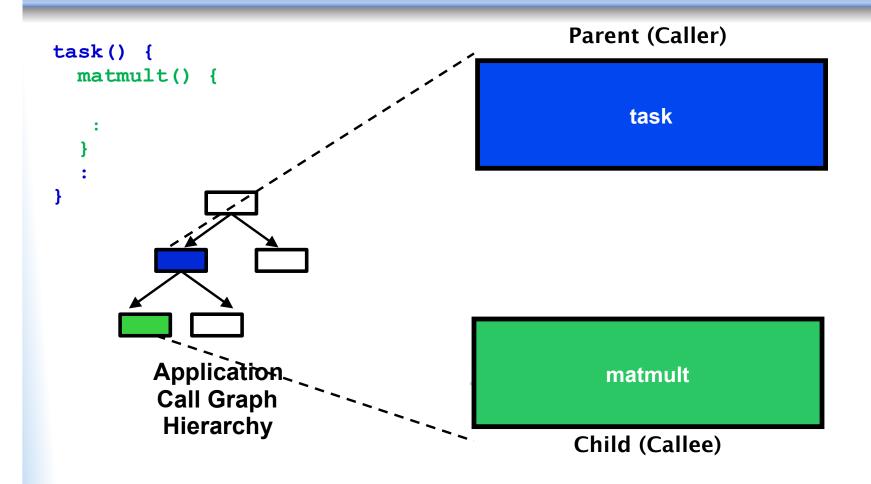
Create as many threads as wanted.

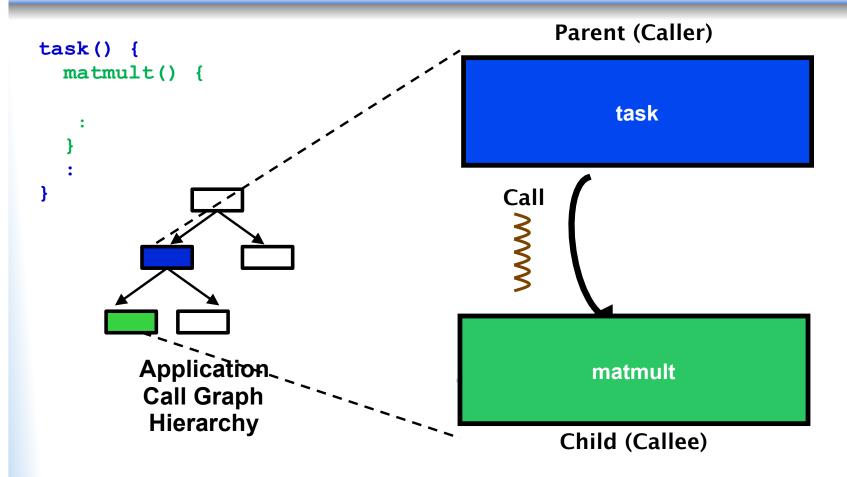
* Allocated a finite amount of harts.

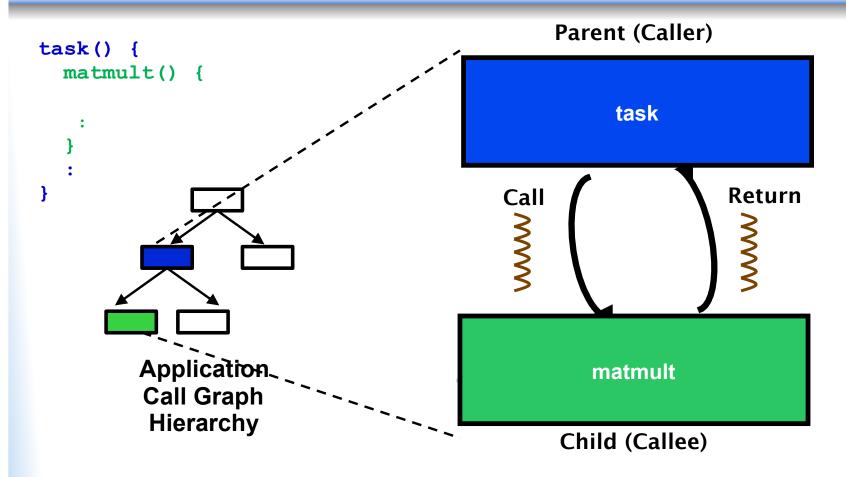


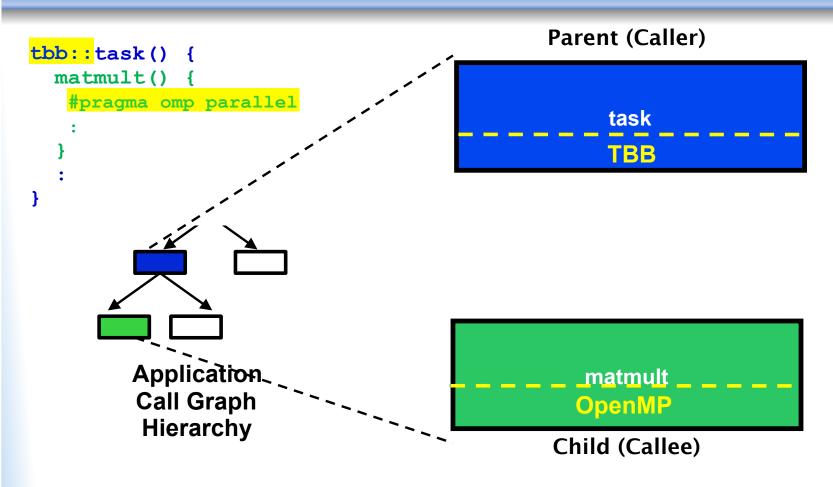
Create as many threads as wanted.

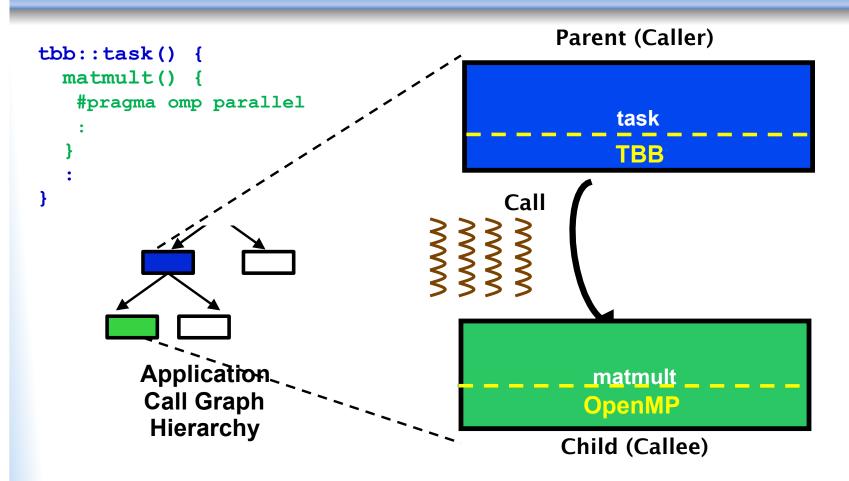
- Allocated a finite amount of harts.
- Threads = Resource + Programming Abstraction Harts = Resource Abstraction



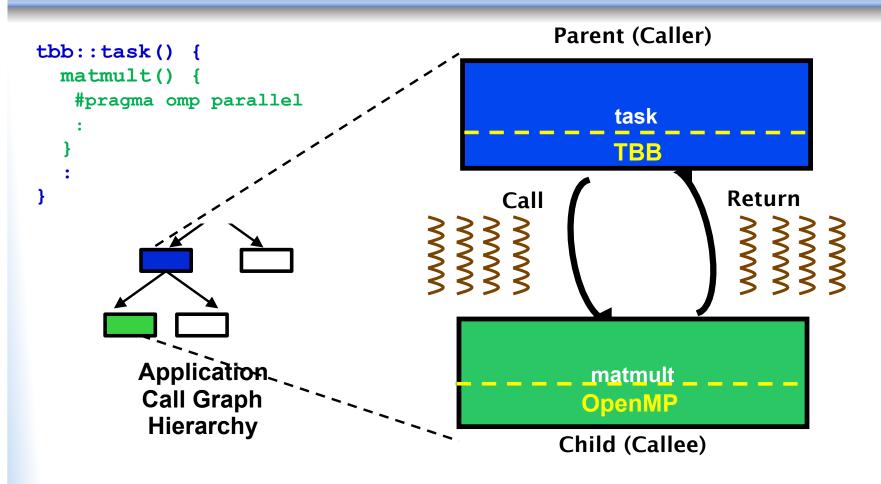




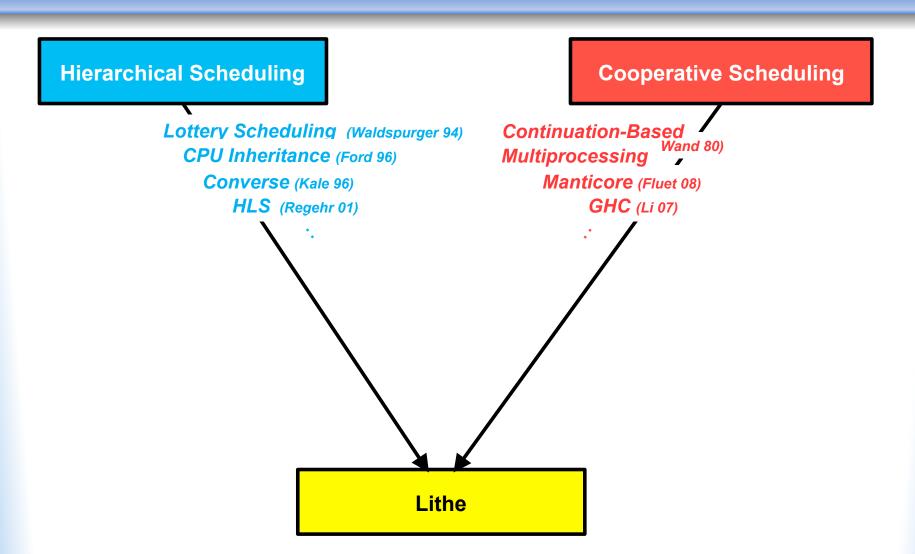


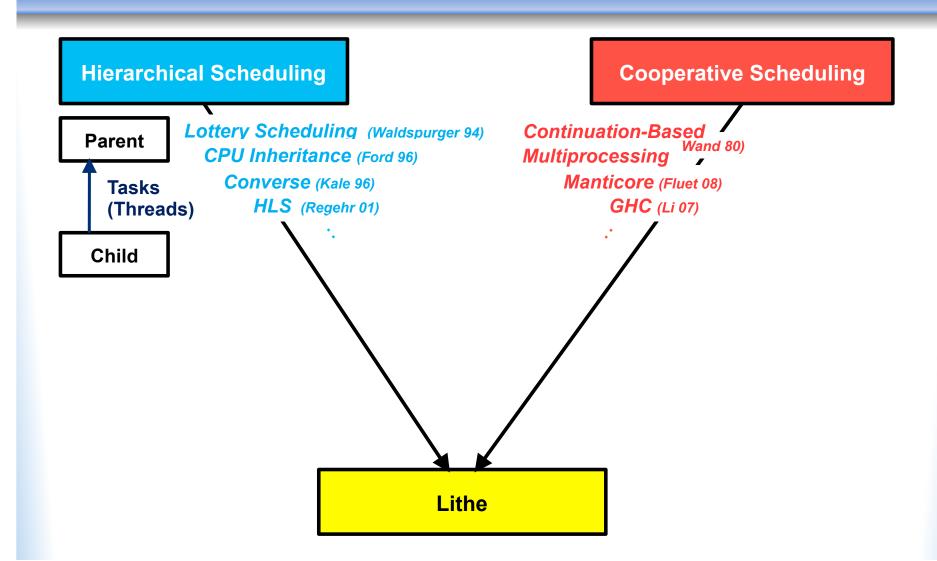


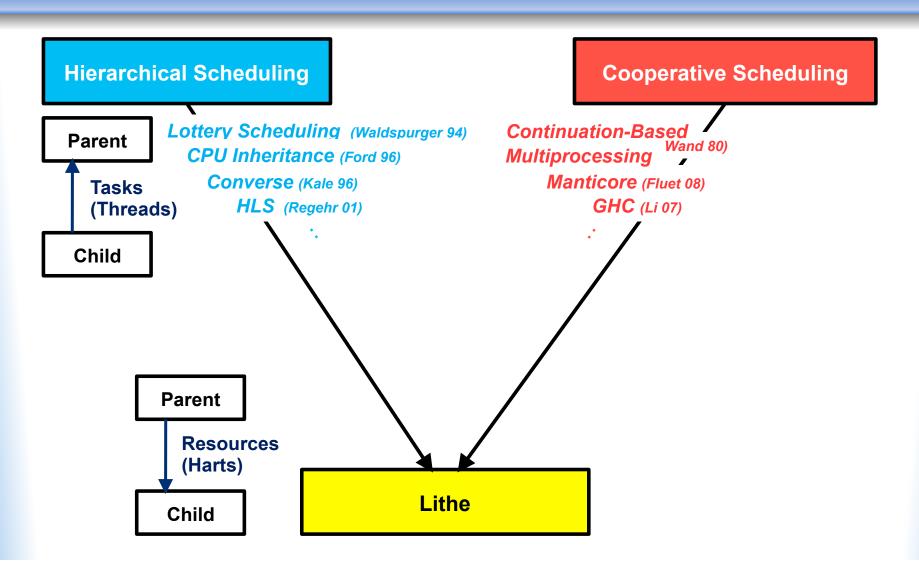
Cooperative Hierarchical Resource Scheduling

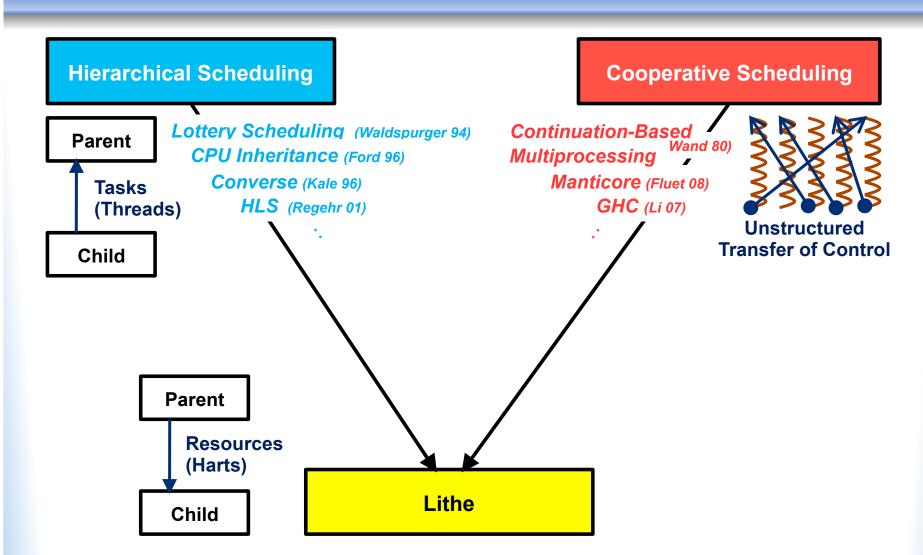


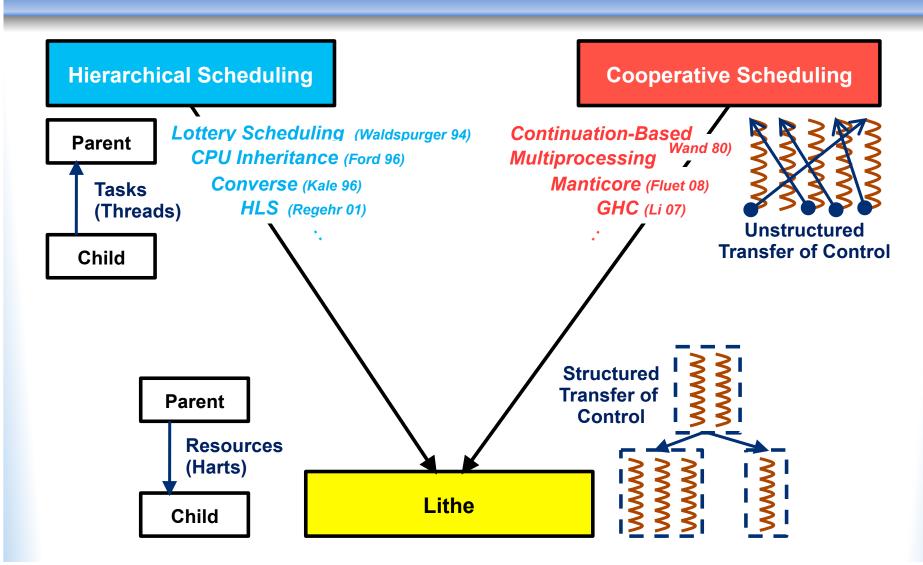
Transfer of control coupled with transfer of resources.

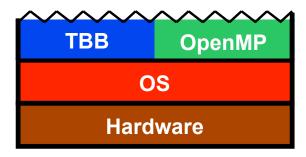


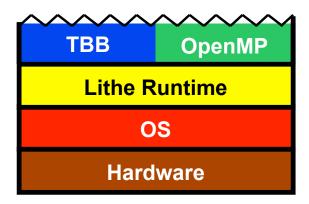


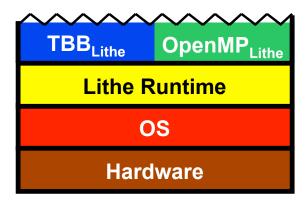


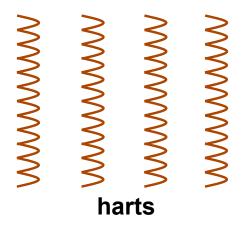


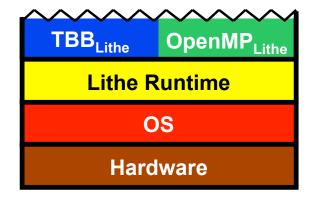


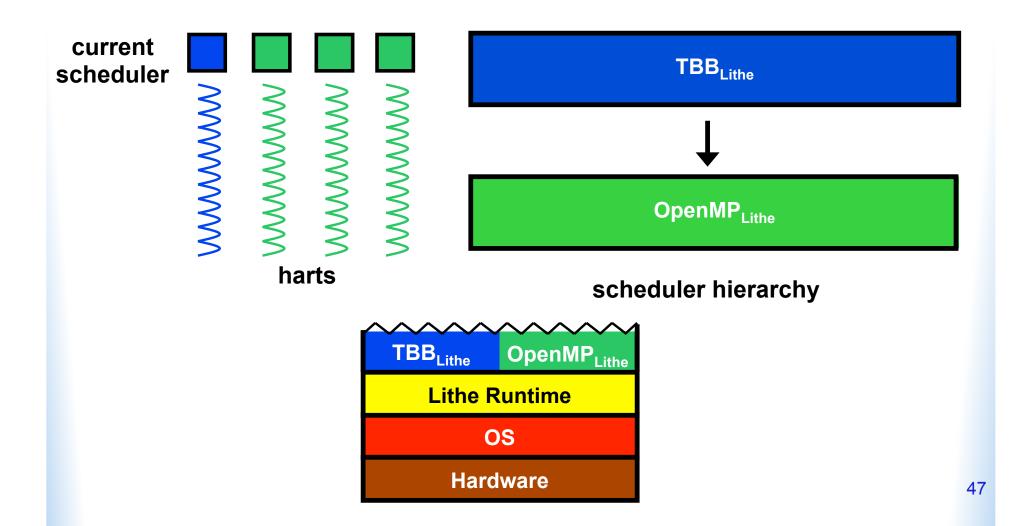


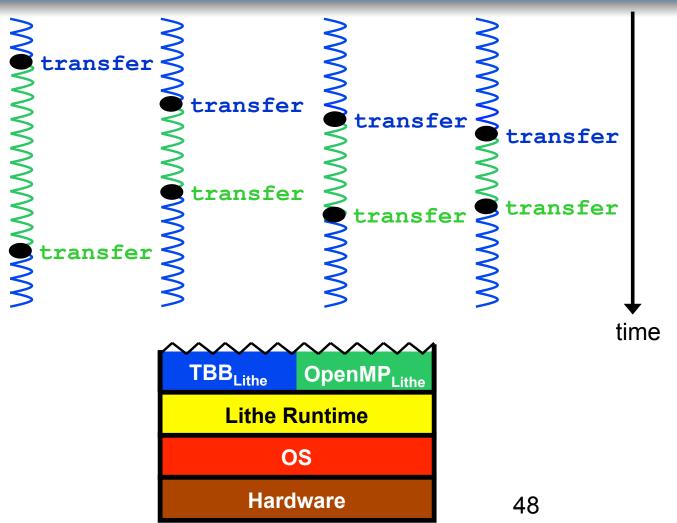






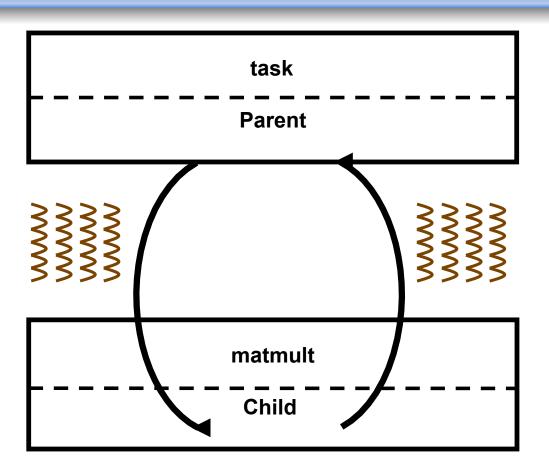




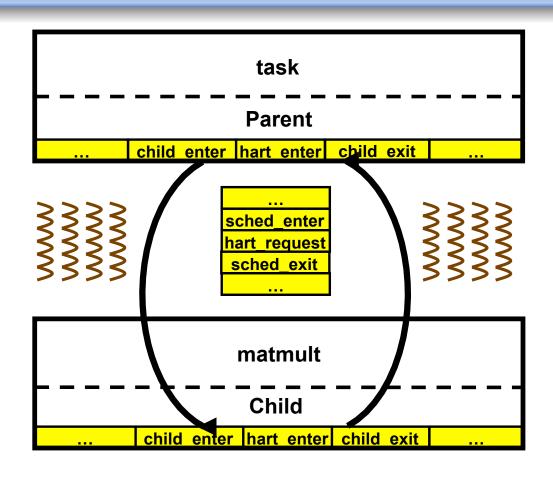


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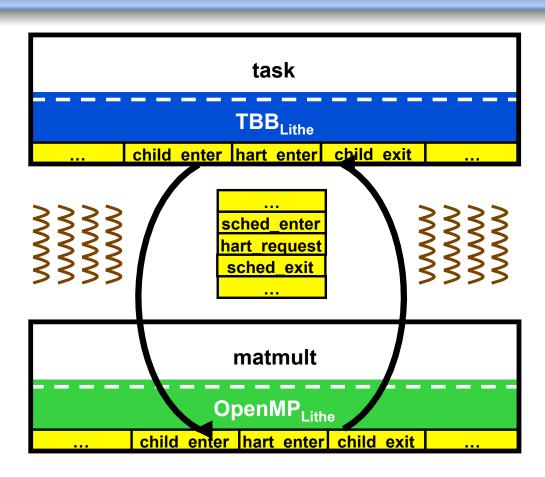
```
task() {
   matmult() {
    :
    }
   :
}
```



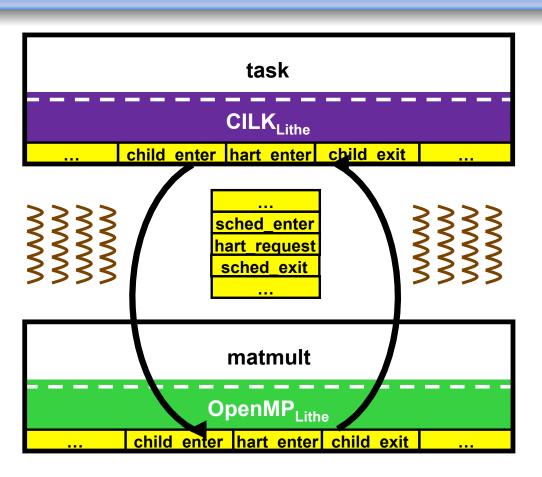
```
task() {
   matmult() {
    :
    }
   :
}
```

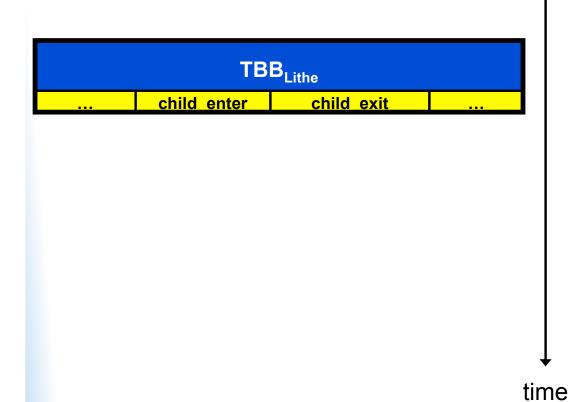


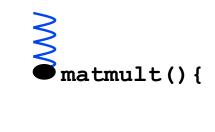
```
tbb::
task() {
   matmult() {
     #pragma OMP parallel
    :
   }
   :
}
```

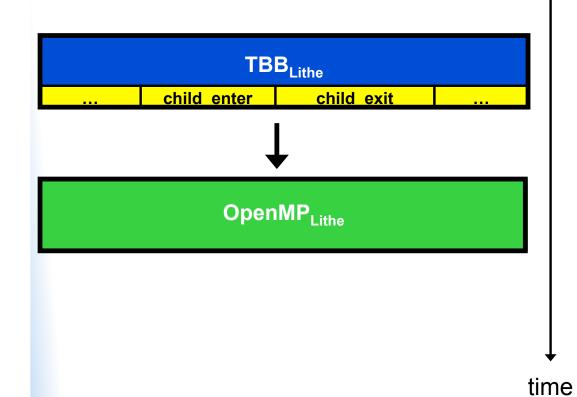


```
cilk
task() {
   matmult() {
     #pragma OMP parallel
    :
   }
   :
}
```

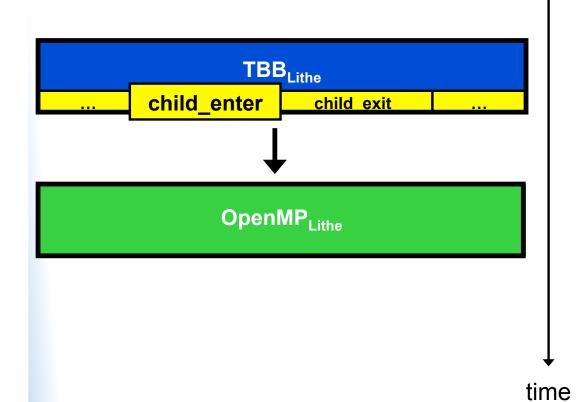




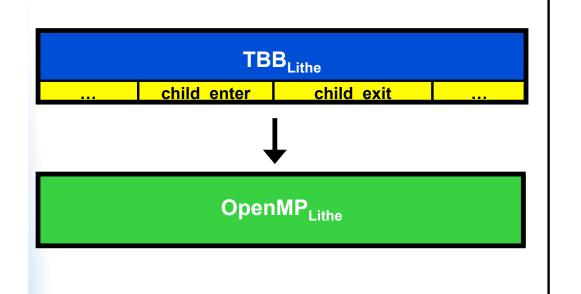




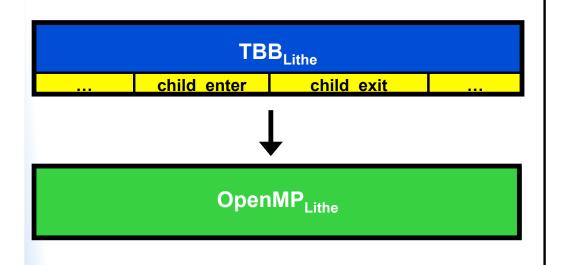
```
matmult() {
   sched_enter(OpenMP<sub>Lithe</sub>);
```



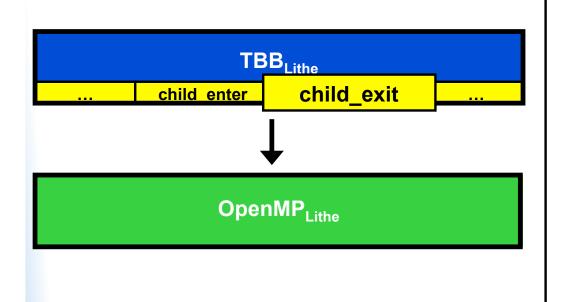
```
matmult() {
   sched_enter(OpenMP<sub>Lithe</sub>);
```



```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    :
    :
    :
}
```



```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    :
    :
    sched_exit();
```



```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    :
    :
    sched_exit();
```

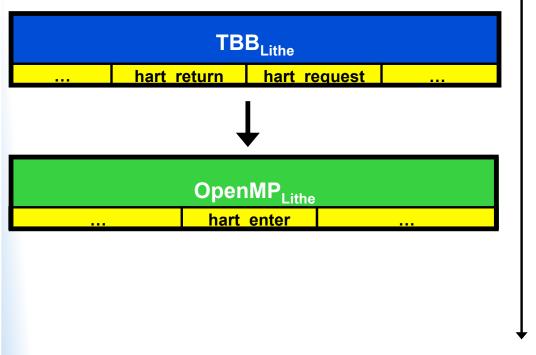


```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    :
    :
    sched_exit();
}
```



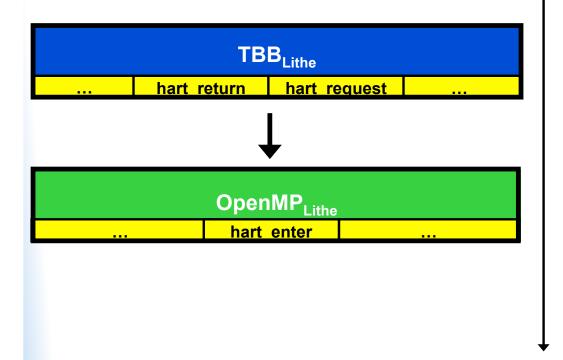
```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    :
    :
    sched_exit();
}
```

sched_enter() dynamically adds the new scheduler to the hierarchy.
sched_exit() dynamically removes a scheduler from the hierarchy.



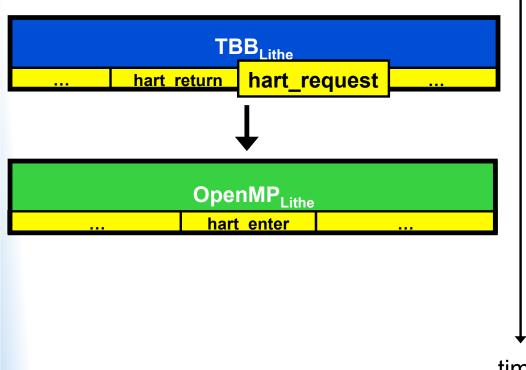
```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
```

time



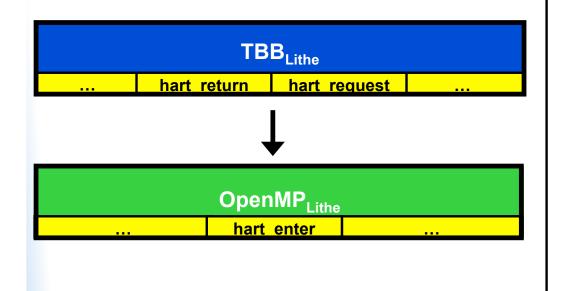
```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
```

time



```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
```

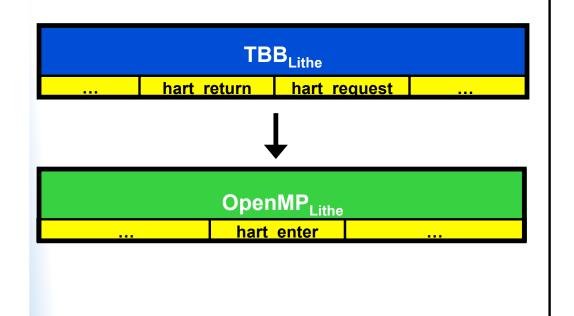
time



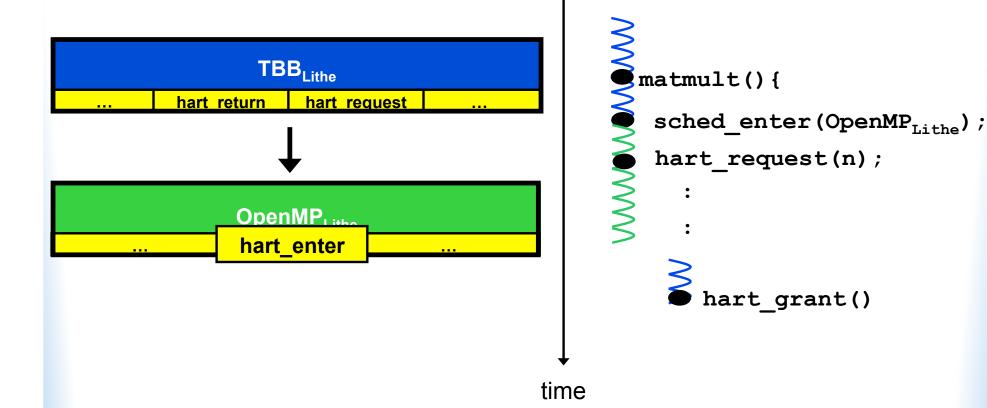
```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
    :
    :
```

time

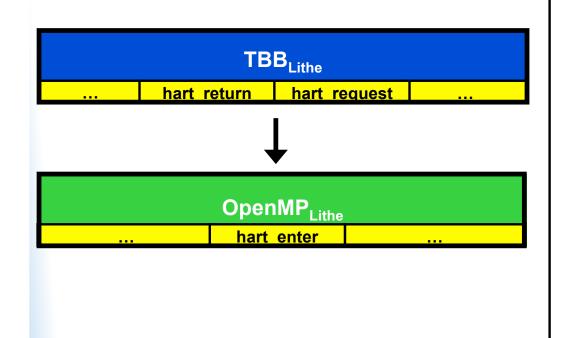
time



```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
    :
    :
    hart_grant()
```

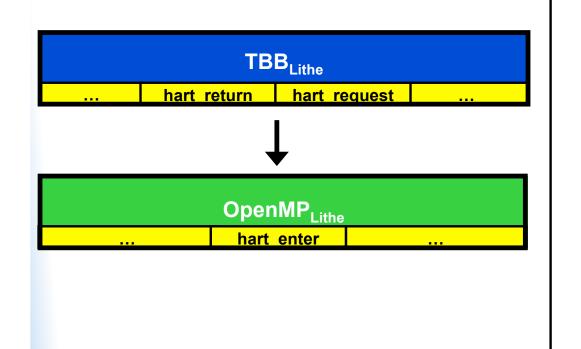


time

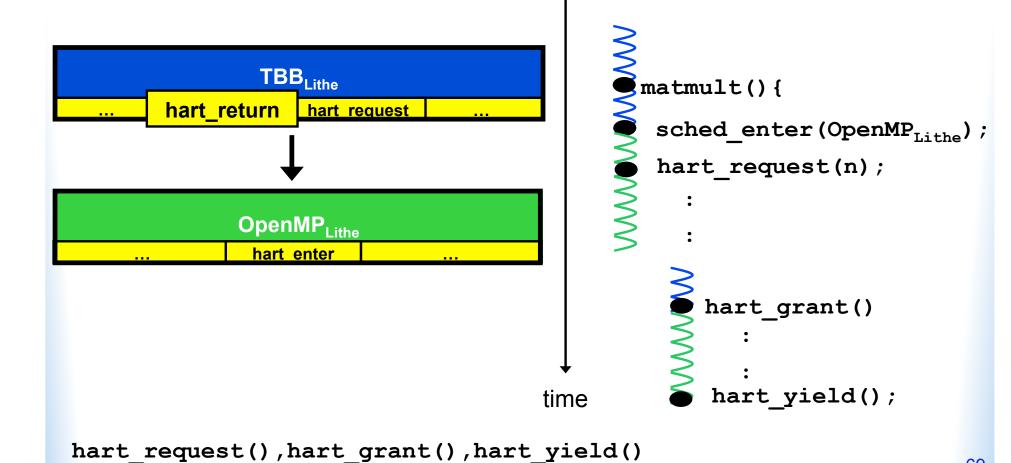


```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
    :
    :
    hart_grant()
    :
    :
}
```

time

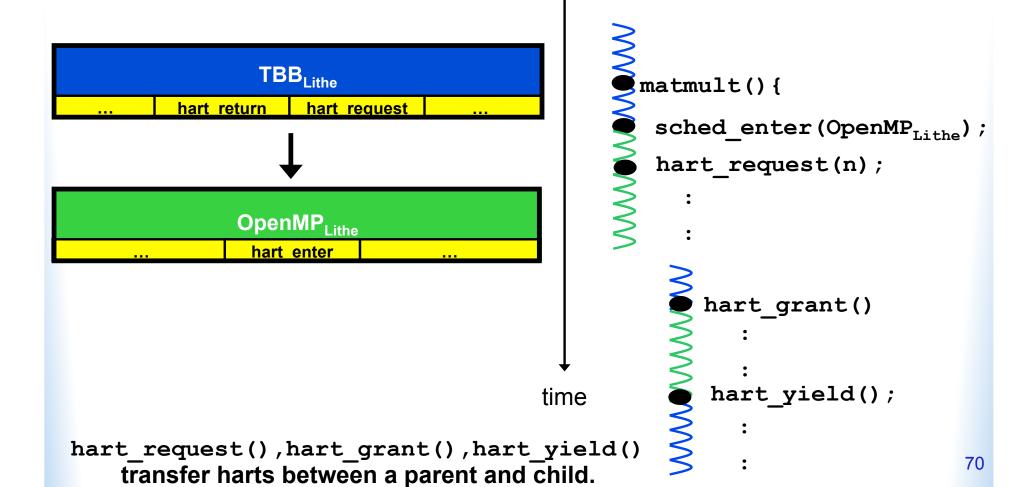


```
matmult() {
    sched_enter(OpenMP<sub>Lithe</sub>);
    hart_request(n);
    :
    :
    hart_grant()
    :
    hart_yield();
```

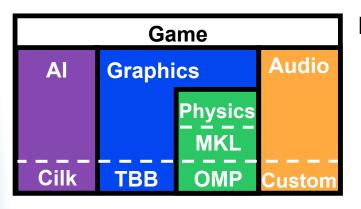


transfer harts between a parent and child.

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Putting it All Together



Hart 0



Hart 1



Hart 2 Hart 3 Time





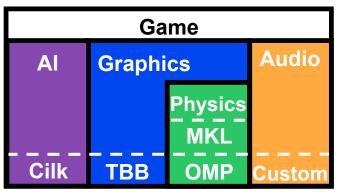
Core 0

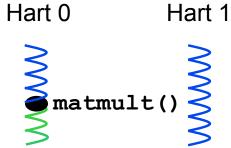






Putting it All Together





```
Hart 2 Hart 3 Time
```

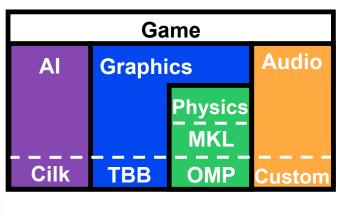
```
tbb::task() {
   matmult() {
     #pragma omp parallel
   :
   }
  :
}
```











```
Hart 0 Hart 1

matmult()

hart_request()
```

```
tbb::task() {
   matmult() {
     #pragma omp parallel
    :
   }
   :
}
```

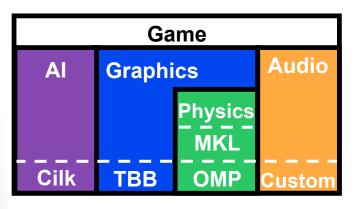
Core 0





Core 2

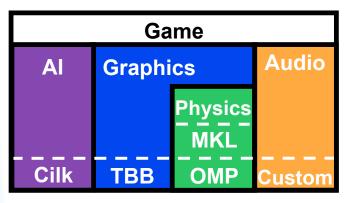
Core 3



```
tbb::task() {
   matmult() {
     #pragma omp parallel
    :
   }
   :
}
```

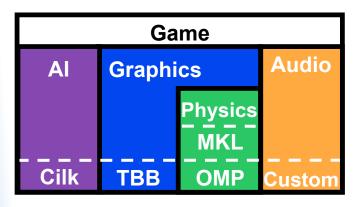
```
Hart 0 Hart 1 Hart 2 Hart 3 Time

matmult()
hart_request()
hart_enter()
```

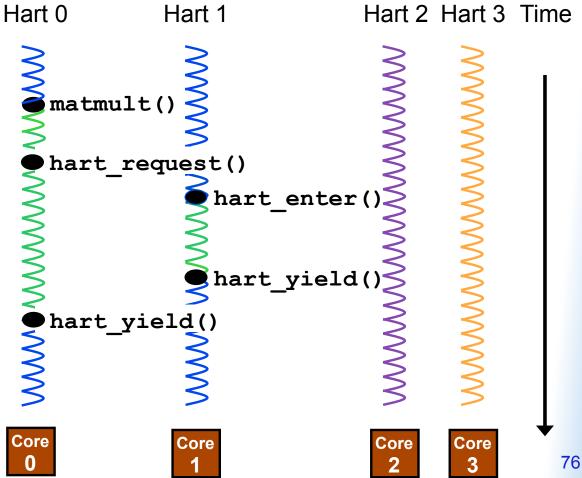


```
tbb::task() {
  matmult() {
    #pragma omp parallel
    :
  }
  :
}
```

```
Hart 0
            Hart 1
                            Hart 2 Hart 3 Time
   matmult()
   hart_request()
                hart enter(
              hart_yield()
```



```
tbb::task() {
  matmult() {
    #pragma omp parallel
    :
  }
  :
}
```



Lithe Context Support

- Basic user-level threading API
 - Integrated directly to work well with harts
 - Can be extended by each library for custom scheduler support
 - Callbacks into scheduler similar to hart callbacks when operation performed

lithe_context_init()
lithe_context_cleanup()
lithe_context_run()
lithe_context_block()
lithe_context_unblock()
lithe_context_yield()
lithe_context_exit()

Real World Example

Sparse QR Factorization

(Tim Davis, Univ of Florida)

SPQR

OS

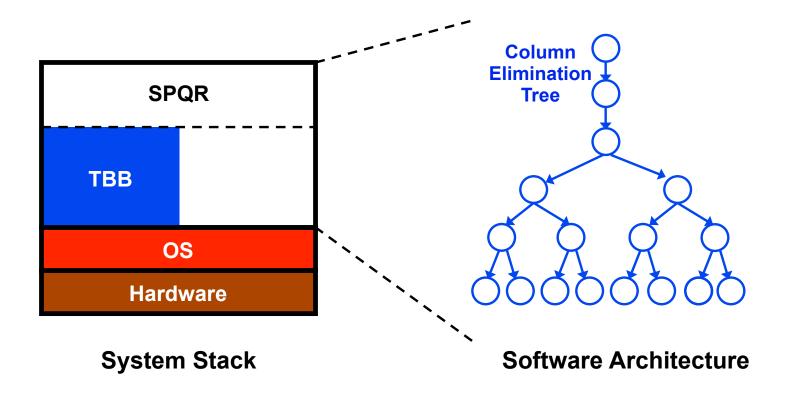
Hardware

System Stack

Real World Example

Sparse QR Factorization

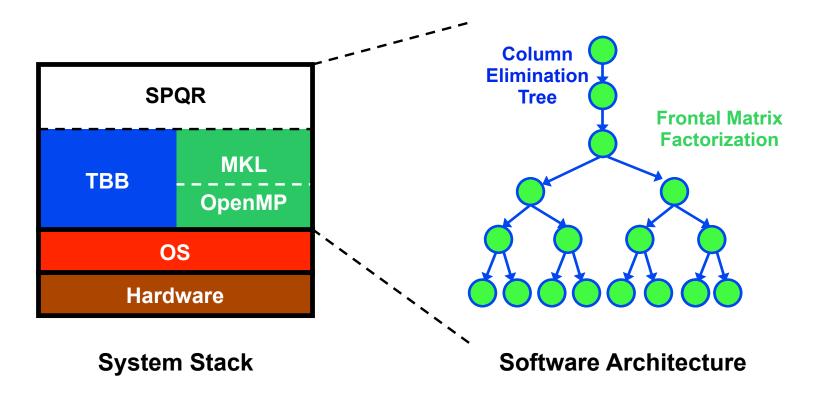
(Tim Davis, Univ of Florida)



Real World Example

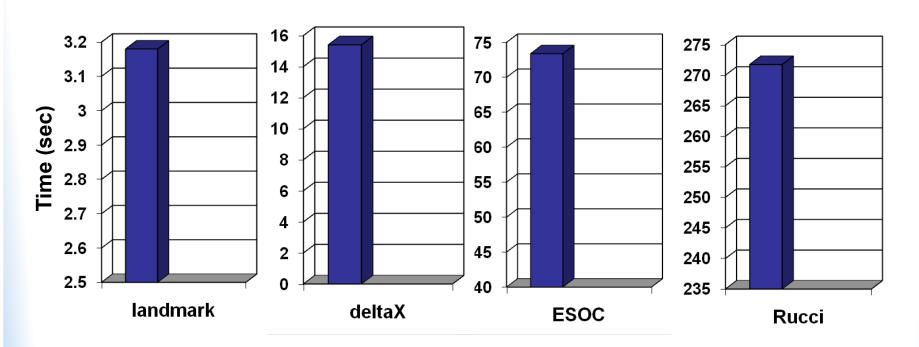
Sparse QR Factorization

(Tim Davis, Univ of Florida)



Performance of SPQR on 16-Core machine

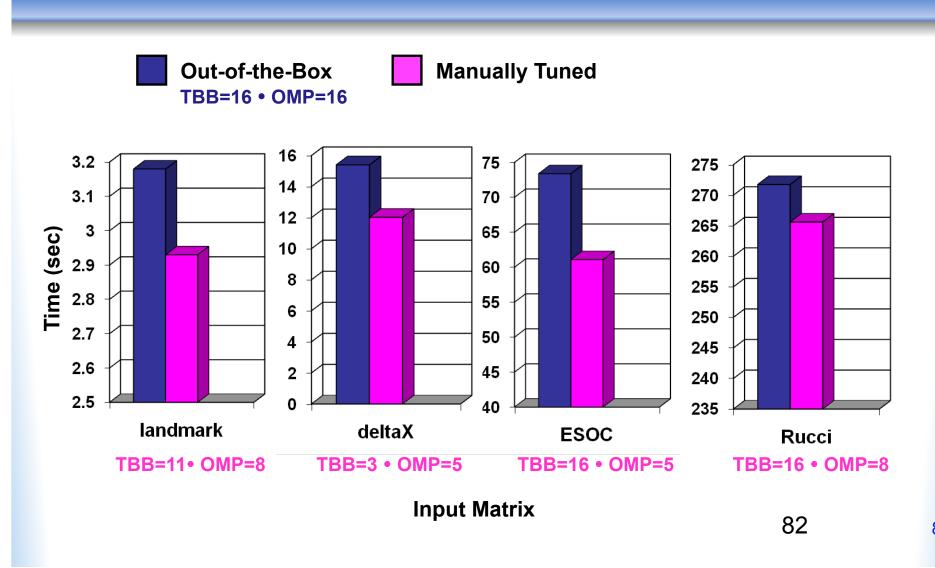




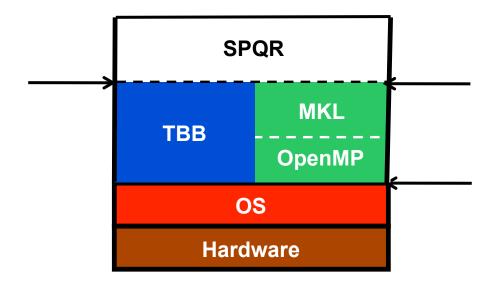
Input Matrix

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Performance of SPQR on 16-Core machine

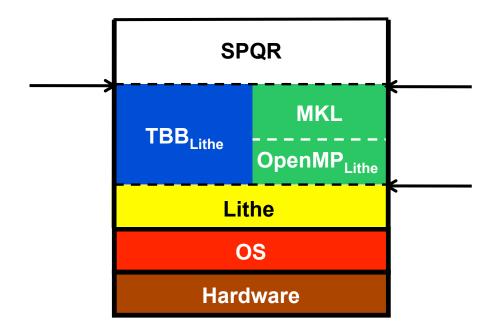


SPQR with Lithe



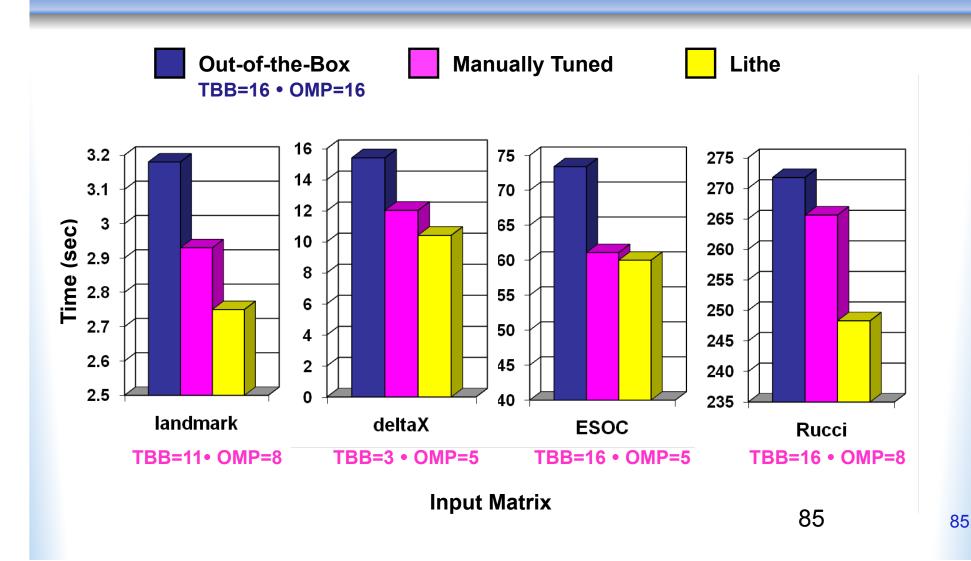
- Library interfaces remain the same
- Zero lines of high-level code changed (SPQR, MKL)

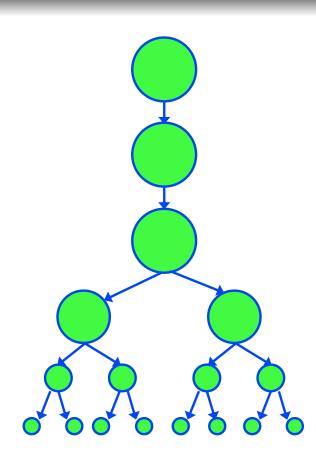
SPQR with Lithe

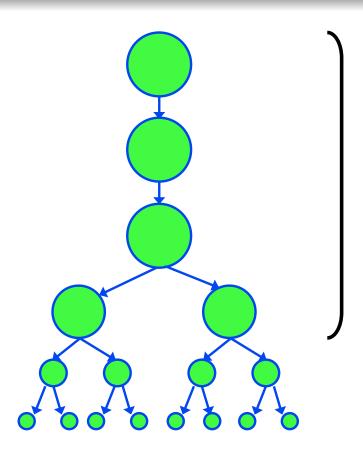


- Library interfaces remain the same
- Zero lines of high-level code changed (SPQR, MKL)
- Just link in Lithe runtime + Lithe versions of libraries (TBB, OpenMP)

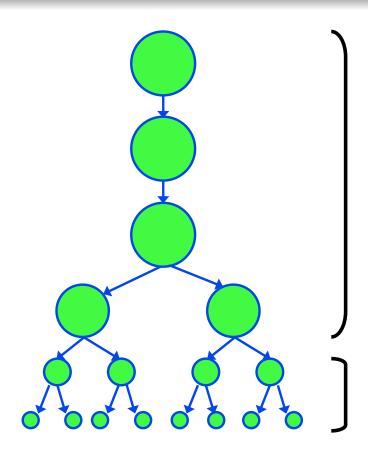
Performance of SPQR with Lithe





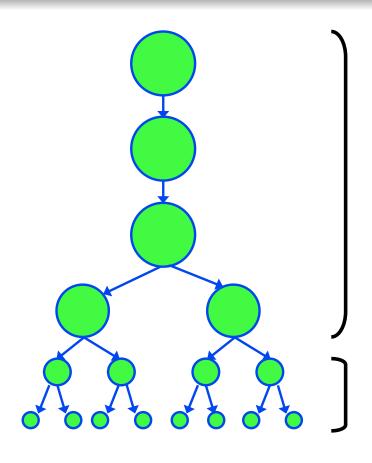


Give resources to OpenMP



Give resources to OpenMP

Give resources to TBB

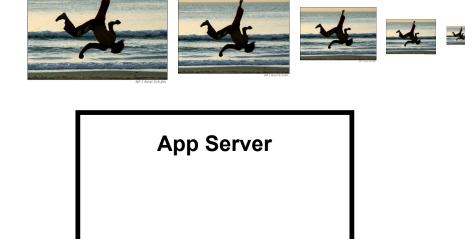


Give resources to OpenMP

Give resources to TBB

Manual tuning is stuck with 1 TBB/OMP config throughout run.

Flickr-Like Image Processing App Server

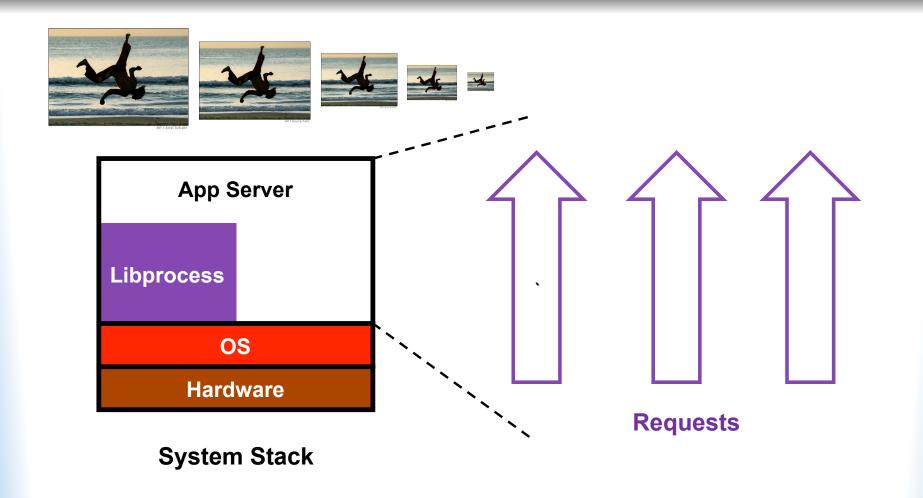


System Stack

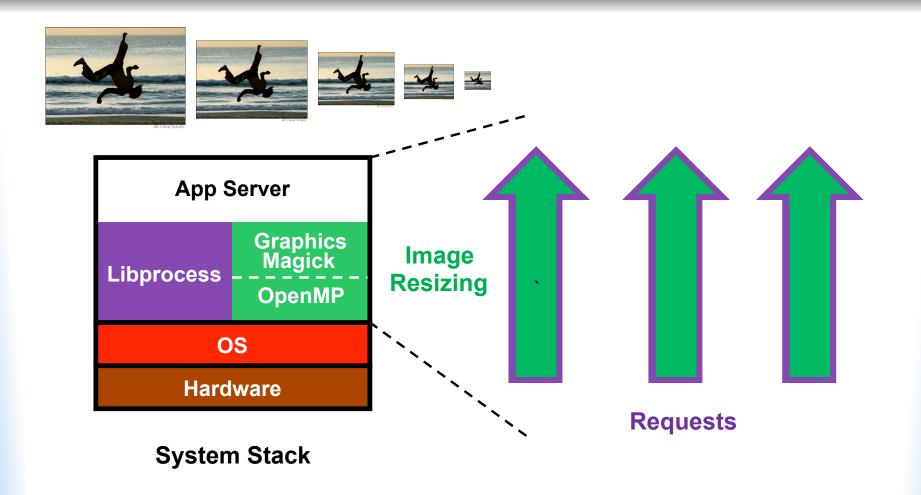
OS

Hardware

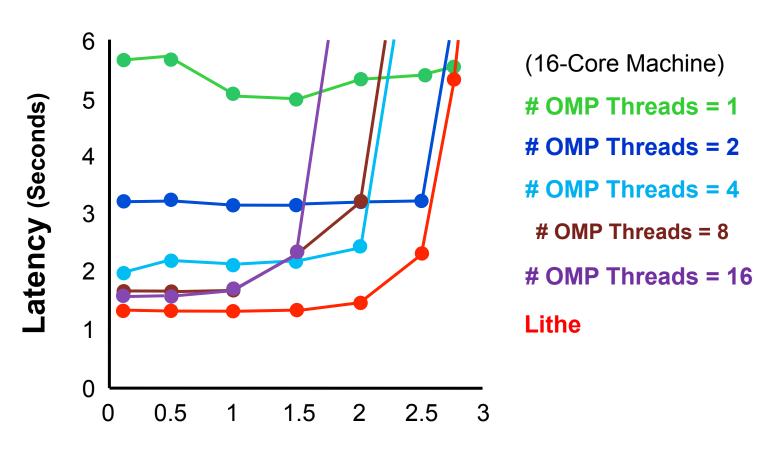
Flickr-Like Image Processing App Server



Flickr-Like Image Processing App Server



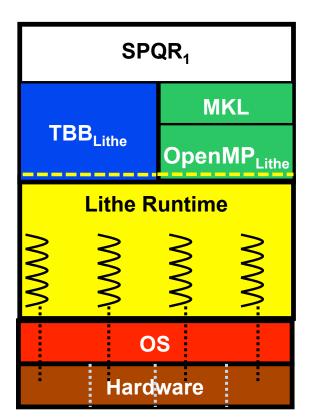
Performance of App Server



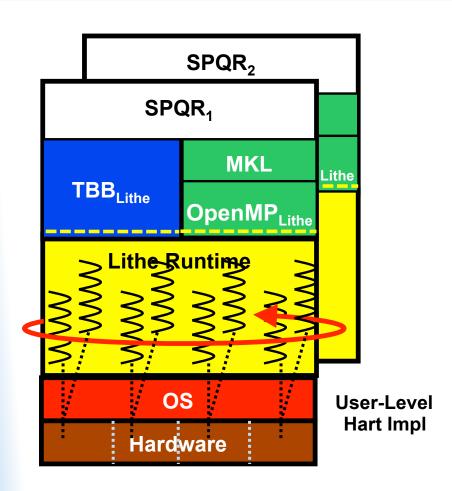
Throughput (Requests / Second)

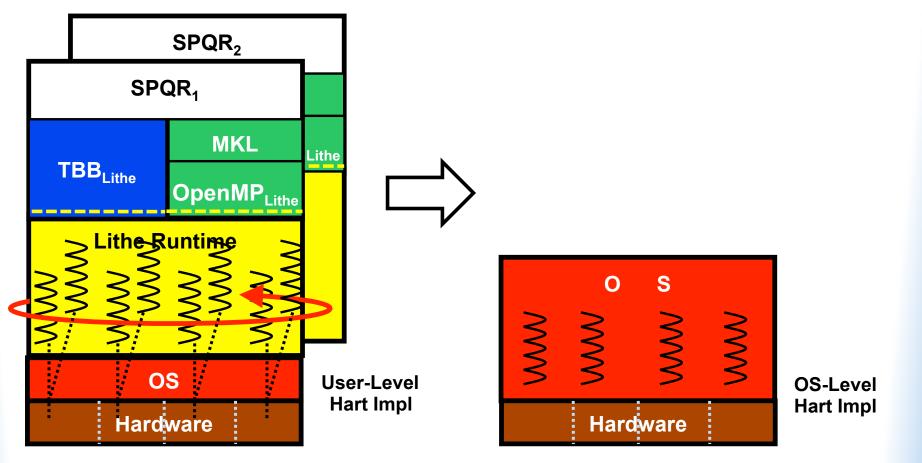
Future Directions

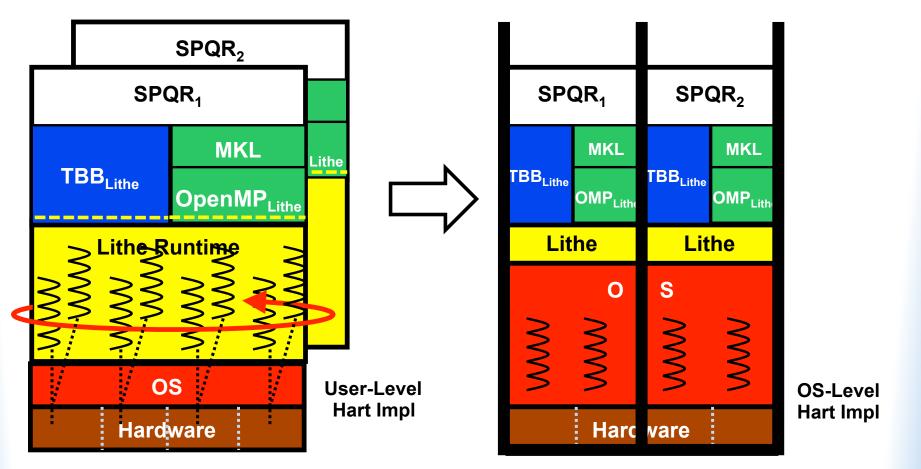
- OS Support for Lithe
 - Akaros, Tessellation
- Preemptive Version of Lithe
 - Direct support for MPI
 - Integrate with GASNet
 - Leverage lithe contexts
- Other ways to integrate with the DEGAS stack?



User-Level Hart Impl

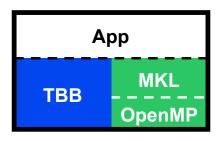






Conclusion

Composability essential for parallel programming to become widely adopted

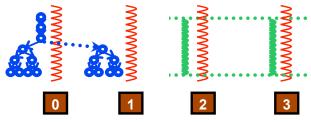




functionality

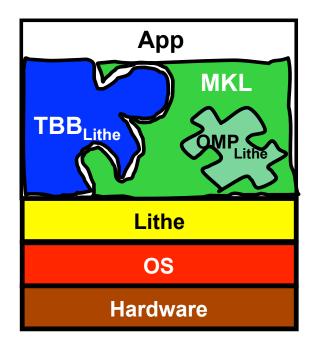
resource management

Parallel libraries need to share resources cooperatively



- Main Contributions
 - Harts: better resource model for parallel programming
 - Lithe: framework for using and sharing harts

Questions?



http://lithe.eecs.berkeley.edu

Preemptive Lithe

- Three–level priority scheme
 - Same Priority → Cooperative
 - Higher priority can only preempt lower
 - Developer sets runtime priorities
 - Lithe runtime enforces priorities

